

## Problem statement

Given a node  $v$  in a game tree

find a winning strategy for MAX (or MIN) from  $v$

or (equivalently)

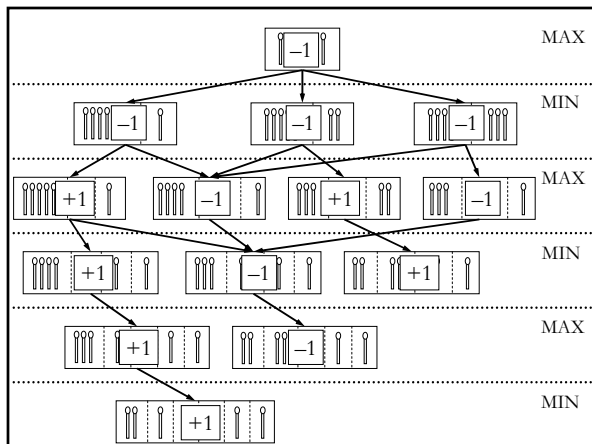
show that MAX (or MIN) can force a win from  $v$

## Minimax

- assumption: players are rational and try to win
- given a game tree, we know the outcome in the leaves
  - assign the leaves to win, draw, or loss (or a numeric value like +1, 0, -1) according to MAX's point of view
- at nodes one ply above the leaves, we choose the best outcome among the children (which are leaves)
  - MAX: win if possible; otherwise, draw if possible; else loss
  - MIN: loss if possible; otherwise, draw if possible; else win
- recurse through the nodes until in the root

## Minimax rules

1. If the node is labelled to MAX, assign it to the maximum value of its children.
  2. If the node is labelled to MIN, assign it to the minimum value of its children.
- MIN minimizes, MAX maximizes  $\rightarrow$  minimax



## Analysis (using negamax)

- simplifying assumptions
  - internal nodes have the same branching factor  $b$
  - game tree is searched to a fixed depth  $d$
- time consumption is proportional to the number of expanded nodes in negamax
  - 1 — root node (the initial ply)
  - $b$  — nodes in the first ply
  - $b^2$  — nodes in the second ply
  - $b^d$  — nodes in the  $d$ th ply
- overall running time  $O(b^d)$

### Rough estimates on running times when $d = 5$

- suppose expanding a node takes 1 ms
- branching factor  $b$  depends on the game
- Draughts ( $b \approx 3$ ):  $t = 0.243$  s
- Chess ( $b \approx 30$ ):  $t = 6\frac{3}{4}$  h
- Go ( $b \approx 300$ ):  $t = 77$  a
- alpha-beta pruning reduces  $b$

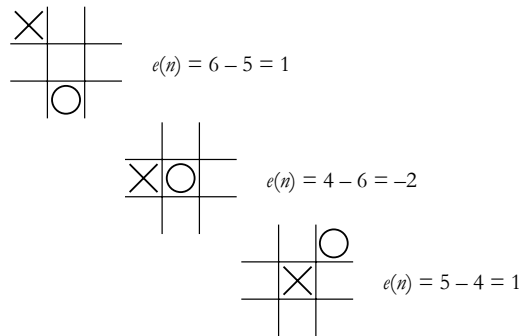
### Choosing search depth

- usually the whole game tree is too large  $\rightarrow$  limit search depth  $\rightarrow$  a partial game tree
- $n$ -move look-ahead strategy
  - stop searching after  $n$  moves
  - make the internal nodes leaves
  - use an evaluation function to 'guess' the outcome

### Example: Noughts and Crosses

- heuristic evaluation function  $e$ :
  - count the winning lines open to MAX
  - subtract the number of winning lines open to MIN
- forced wins
  - state is evaluated  $+\infty$ , if it is a forced win for MAX
  - state is evaluated  $-\infty$ , if it is forced win for MIN

### Examples of the evaluation



### Drawbacks of the look-ahead approach

- horizon effect
  - heuristically promising path can lead to an unfavourable situation
  - solution: extend look-ahead on promising nodes  $\rightarrow$  does not remove the problem
- bias
  - we want to have an estimate of minimax but get a minimax of estimates